

# t8code - modular adaptive mesh refinement in the exascale era

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## Summary

In this note we present our software library t8code for scalable dynamic adaptive mesh refinement (AMR) officially released in 2022 ([Holke et al., 2022](#)). t8code is written in C/C++, open source, and readily available at [www.dlr-amr.github.io/t8code](http://www.dlr-amr.github.io/t8code). The library provides fast and memory efficient parallel algorithms for dynamic AMR to handle tasks such as mesh adaptation, load-balancing, ghost computation, feature search and more. t8code can manage meshes with over one trillion mesh elements ([Holke et al., 2021](#)) and scales up to one million parallel processes ([Holke, 2018](#)). It is intended to be used as mesh management back end in scientific and engineering simulation codes paving the way towards high-performance applications of the upcoming exascale era.

## Introduction

AMR has been established as a successful approach for scientific and engineering simulations over the past decades ([Babuvška & Rheinboldt, 1978](#); [Bangerth et al., 2007](#); [Dörfler, 1996](#); [Teunissen & Keppens, 2019](#)). By modifying the mesh resolution locally according to problem specific indicators, the computational power is efficiently concentrated where needed and the overall memory usage is reduced by orders of magnitude. However, managing adaptive meshes and associated data is a very challenging task, especially for parallel codes. Implementing fast and scalable AMR routines generally leads to a large development overhead motivating the need for external mesh management libraries like t8code.

t8code is written in C/C++, open source, and the latest release can be obtained at <https://dlr-amr.github.io/t8code> ([Holke et al., 2022](#)). It uses efficient space-filling curves (SFC) to manage the data in structured refinement trees. While in the past being successfully applied to quadrilateral and hexahedral meshes ([Burstedde et al., 2011](#); [Weinzierl, 2019](#)), t8code extends these SFC techniques in a modular fashion, such that arbitrary element shapes are supported. We achieve this modularity through a novel decoupling approach that separates high-level (mesh global) algorithms from low-level (element local) implementations. All high-level algorithms can then be applied to different implementations of element shapes and refinement patterns. A mix of different element shapes in the same mesh is also supported.

Currently, t8code provides implementations of Morton type SFCs with  $1 : 2^d$  refinement for vertices ( $d = 0$ ), lines ( $d = 1$ ), quadrilaterals, triangles ( $d = 2$ ), hexahedra, tetrahedra, prisms, and pyramids ( $d = 3$ ). The latter having a  $1 : 10$  refinement rule with tetrahedra emerging as child elements ([Knapp, 2020](#)). Additionally, implementation of other refinement patterns and SFCs is possible according to the specific requirements of the application.

The purpose of this note is to provide a brief overview and a first point of entrance for software developers working on codes storing data on (distributed) meshes.

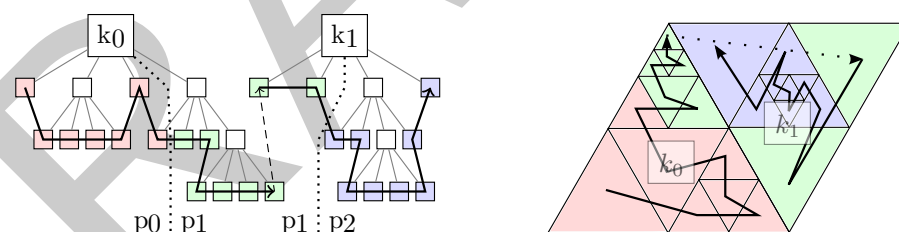
For further information beyond this short note and also for code examples, we refer to our Documentation and Wiki (Holke et al., 2022) and our other technical papers on t8code (Becker, 2021; Burstedde & Holke, 2016, 2017; Dreyer, 2021; Elsweijer, 2021; Holke, 2018; Holke et al., 2021; Knapp, 2020; Lilikakis, 2022).

## Fundamental Concepts

t8code is based on the concept of tree-based adaptive mesh refinement. Starting point is an unstructured input mesh, which we call coarse mesh that describes the geometry of the computational domain. The coarse mesh elements are refined recursively in a structured pattern, resulting in refinement trees of which we store only minimal information of the finest elements (the leaf nodes of the tree). We call this resulting fine mesh the forest.

By enumerating the children in the refinement pattern we obtain a space-filling curve logic. Via these SFCs, all elements in a refinement tree are assigned an index and are stored in linear order of these indices. Information such as coordinates or element neighbors do not need to be stored explicitly, but can be recovered from the index and the appropriate information of the coarse elements. The less elements the input mesh has, the more memory and runtime are saved through the SFC logic. t8code supports distributed coarse meshes of arbitrary size and complexity, which we tested for up to 370 million input elements (Burstedde & Holke, 2017).

The forest mesh is distributed, that is, at any time, each parallel process only stores a unique portion of the forest mesh, the boundaries of which are calculated from the SFC indices; see Figure 1.



**Figure 1:** Left: Quad-tree of an exemplary forest mesh consisting of two trees ( $k_0$ ,  $k_1$ ) distributed over three parallel processes  $P_0$  to  $P_2$ . The SFC is represented by a black curve tracing only the finest elements (leaf nodes) of each tree. Right: Sketch of the associated triangular mesh refined up to level three.

## Interfacing with t8code

In this section we discuss the main interface of t8code and how an application would use it. While t8code offers various ways to interact with meshes and data, we restrict ourselves to the most important functionality here.

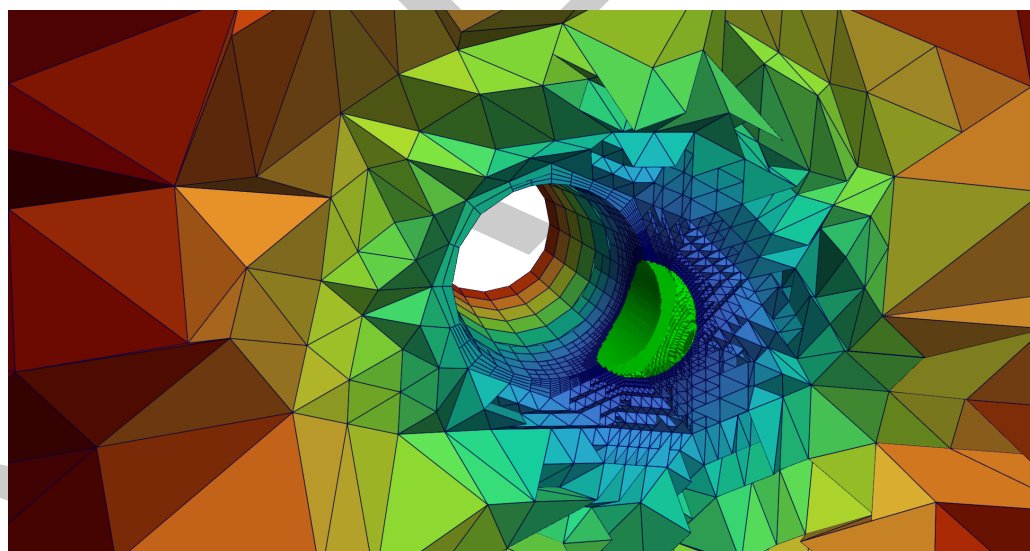
Every application is different and comes with their own requirements, data, and adaptation criteria. In order to support a wide variety of use cases, our core philosophy for t8code is to impose as few assumptions and to offer as much freedom as possible. We cater for this by applying the Hollywood principle: “Don’t call us, we’ll call you!”. Whenever an application needs to interact with the mesh, e.g., adapting the mesh, interpolating data, etc., we offer suitable callback handlers.

The application developer implements custom callback functions and registers them via the t8code application programming interface (API). Any mesh specific details on how to access

individual elements in the forest is opaque to the application and internally handled by t8code in an efficient manner. Of course, any typical application using hierarchical meshes needs to store data on the elements of a forest. This data might correspond to some simulated state variables, e.g., fluid velocity and temperature in a CFD simulation. In accordance to our core philosophy, the data is only loosely coupled with t8code's data structures. In order to properly access the application data in the callbacks, the data simply needs to be provided as a consecutive array with one entry per element enumerated in SFC order. For parallel applications, access to neighboring elements across parallel zones (ghost layer) is provided in a similar fashion.

## An example application

In the following section, we want to discuss the most important high-level operations implemented in t8code. For this, consider a 3D numerical solver application that traces a flow bubble moving around a rotating cylinder. The application runs in parallel and the mesh is dynamically adapted in (almost) every time step resolving the moving bubble with higher resolution than the surrounding domain. These perpetual mesh changes constantly require the flow state data to be interpolated from one adaption step to the next. A visualization of such a setup might look like Figure 2.



**Figure 2:** Meshed region of fluid flow around a rotating cylinder. The green blob corresponds to a bubble that is transported within the moving fluid. The mesh is particularly refined along the boundary of the bubble. Colors encode the element's distance from the bubble.

The standard way to implement such an application is to use the following high-level t8code operations: New, Adapt, Balance, Interpolate, Partition, Ghost, Iterate. This is also illustrated in the flowchart in Figure 3. Next, we give more details about the different operations:

**New** Construct a new, uniformly refined mesh from a coarse geometry mesh. This mesh is already distributed across the parallel processes. This step is usually only carried out once during the preprocessing phase.

**Adapt** Decide for each element whether to refine, coarsen, or pass according to the results of a criterion provided by a custom adaption callback.

**Balance** Establishes a 2:1 balance condition, meaning that afterwards the refinement levels of neighboring elements are either the same or differ by at most  $\pm 1$ . Note, this operation only refines elements, never coarsens them.

Applications are free to decide whether they require the balance condition or

not.

**Interpolate** Interpolate data from one forest mesh to another. For each element that was refined, coarsened or remained the same, an application provided callback is executed deciding how to map the data onto the new mesh.

**Partition** Re-partition the mesh across all parallel processes, such that each process has the same computational load (e.g. element count). Due to the SFC logic, this operation is very efficient and may be carried out in each time step.

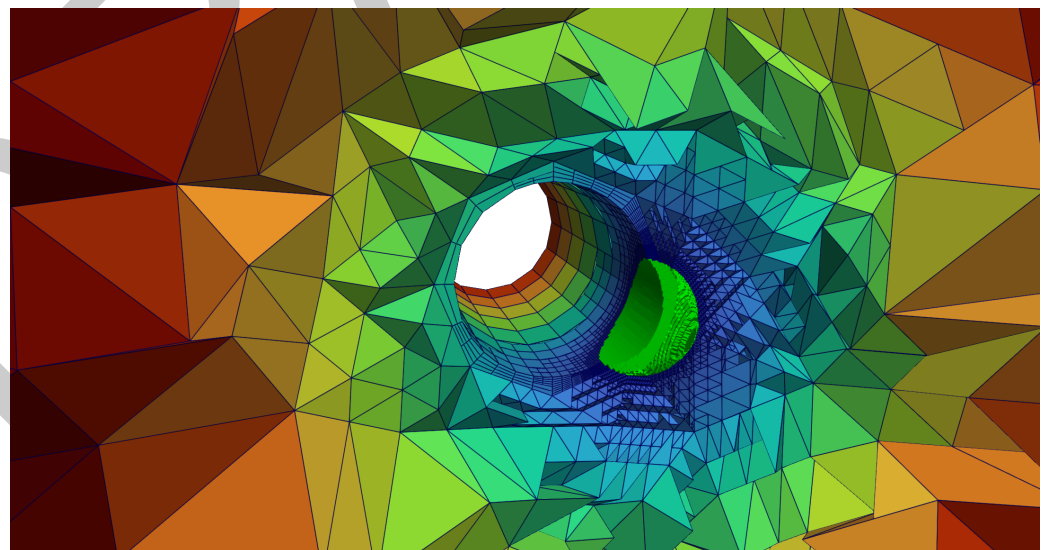
**Partition Data** Redistribute any user defined data from the original mesh to the re-partitioned one. Input is an array with one entry for each element of the original forest containing the application data, output is an array with one entry for each element of the re-partitioned forest, containing the same data (that may previously have been on a different process).

**Ghost** Compute a list of all ghost elements of the current process. Ghosts are elements that are neighbors to elements of the process, but do not belong to the process itself.

**Ghost exchange** Transfer application specific data across all ghost elements. Input is an array of application data with one filled entry for each local element and one unfilled entry for each ghost. On output the entries at the ghost elements will be filled with the corresponding values from the neighbor processes.

**Iterate** Iterates through the mesh, providing face neighbor information for each element passed as an argument to the callback. In our example application, it is used to carry out the advection step of the bubble.

**Search** May be used additionally for extra tasks, such as searching for particles, or identifying flow features. It hierarchically iterates through the mesh and executes a callback function on all elements that match a given criterion. Leveraging the SFC tree logic, Search omits large chunks of the mesh if they do not match the criterion. Hence, it does not necessarily inspect each individual element and therefore performs much faster than a linear search (Burstedde, 2020; Holke et al., 2021).



**Figure 3:** Flowchart of a typical simulation code which interacts with t8code. Information about the different operations can be found in the text.

## 133 Modularity & Extensibility

134 A distinct feature of t8code compared to similar AMR libraries is its high modularity achieved  
135 by decoupling high-level from low-level algorithms and coming along with it the support for  
136 arbitrary element shapes and refinement patterns. It also allows to combine different element  
137 shapes within the same mesh (hybrid meshes).

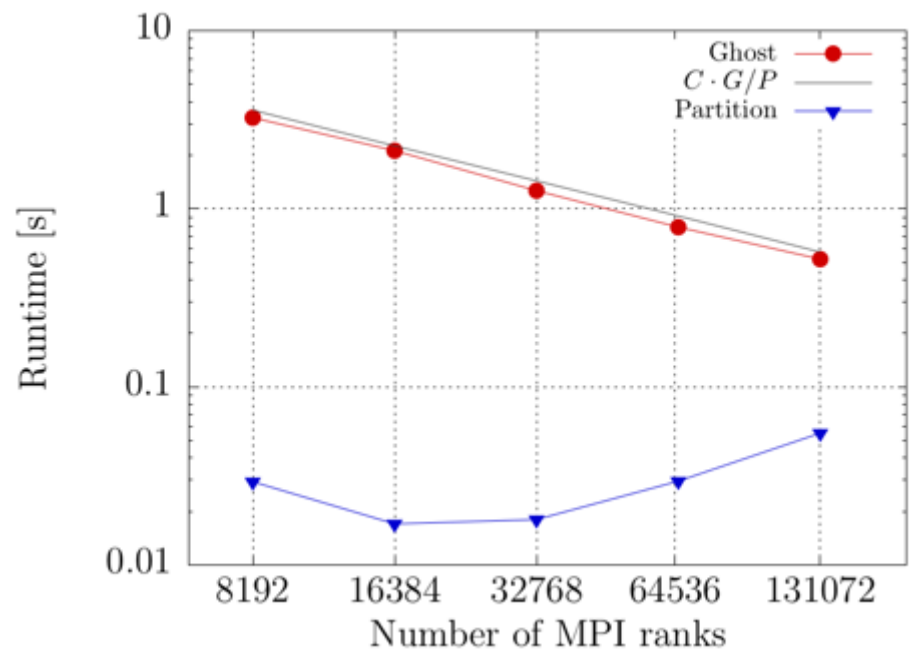
138 All high-level operations use the low-level algorithms only as a black box. For example, mesh  
139 adaption routines iterate through the mesh and when necessary call low-level algorithms for  
140 retrieving the children or the parent to refine or coarsen an element. In order to implement the  
141 logic of the adaption, however, no knowledge of the implementation details of these low-level  
142 functions is required.

143 Thus, for each individual tree we can simply replace the underlying implementation of the  
144 low-level algorithms (e.g. from tetrahedra to hexahedra) without affecting the high-level  
145 functionality. We achieve this by encapsulating all shape-specific element operations such as  
146 parent/child computation, face-neighbor computation, SFC index computation and more in  
147 an abstract C++ base class. The different element shapes and refinement patterns are then  
148 specializations of this base class. Hence, t8code can be easily extended - also by application  
149 developers - to support other refinement patterns and SFCs.

150 Moreover, this very high degree of modularity allows us to support an even wider range  
151 of non-standard additions. For example, the insertion of sub-elements to resolve hanging  
152 nodes ([Becker, 2021](#)) in quadrilateral meshes. Each quad element that has a hanging node is  
153 subdivided into a set of several triangles eliminating the hanging node.

154 Furthermore, we added support for holes in the mesh by selectively deleting elements ([Lilikakis, 2022](#)). This feature can be used to incorporate additional geometry information into the mesh. Similar to marking elements as getting refined or coarsened, we can additionally mark elements as getting removed. These elements will be eliminated completely from the SFC reducing the overall memory footprint.

159 Additionally, we support curved hexahedra with geometry-informed AMR ([Elsweijer, 2021](#)).  
160 Thus, information such as element volumes, face areas, or positions of interpolation/quadrature  
161 points in high order meshes can be calculated exactly with respect to the actual geometry.  
162 Another use case is to start with a very coarse input mesh and geometrically refine the mesh  
163 maxing out the performance benefits of tree-based AMR.



**Figure 4:** Strong scaling on JUWELS with tetrahedral elements. We plot the runtimes of Ghost and Partition routines with a refinement band from levels 8 to 10 after four time steps. Hence, the forest mesh consists of approximately 1.91 billion tetrahedra. As observed in the plot, we achieve perfect scaling for the Ghost algorithm in the number  $G/P$  of ghosts per process. The runtime of Partition is below 0.1 seconds even for the largest run. More details can be found in (Holke et al., 2021).

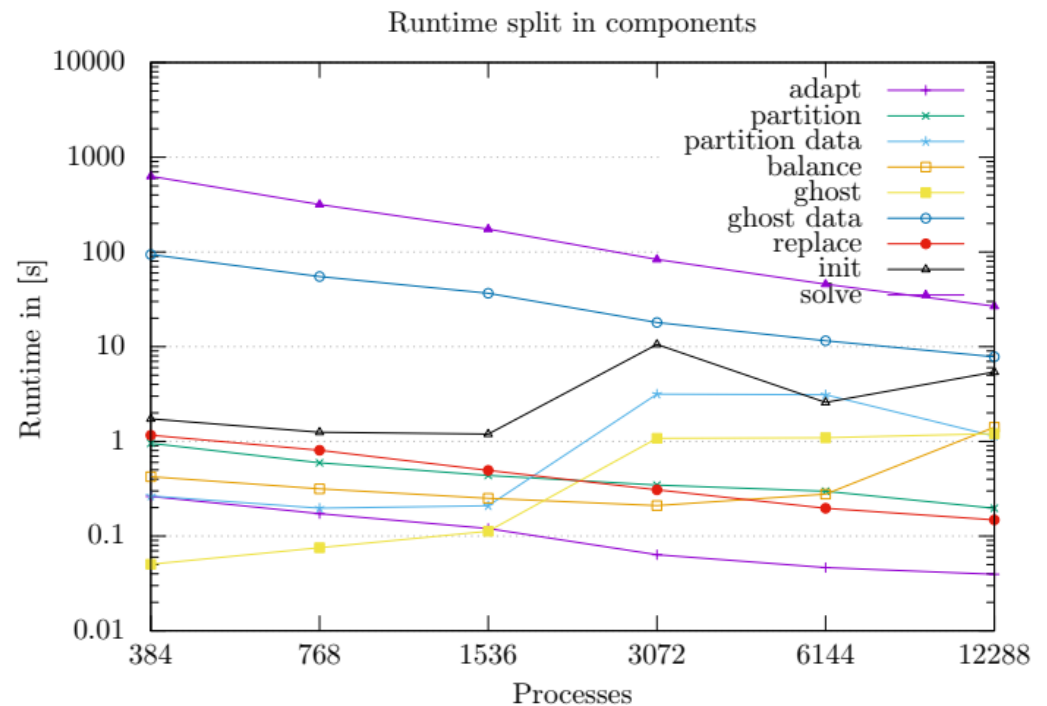
## Performance

In this section we present some of our benchmark results from various performance studies conducted on the JUQUEEN ([JUQUEEN Supercomputer, n.d.](#)) and the JUWELS ([JUWELS Supercomputer, n.d.](#)) supercomputers at the Jülich Supercomputing Center. t8code's Ghost and Partition routines are exceptionally fast with proper scaling of up to 1.1 trillion mesh elements; see Table 1, (Holke et al., 2021). In Figure 4 we show a strong scaling result for a tetrahedral mesh achieving ideal strong scaling efficiency for the Ghost algorithm. Furthermore, in a prototype code (Dreyer, 2021) implementing a high-order discontinuous Galerkin method (DG) for advection-diffusion equations on dynamically adaptive hexahedral meshes we observe a 12 times speed-up compared to non-AMR meshes with only an overall 10 to 15% runtime contribution of t8code; see `autoref{fig:t8code_runtimes}`.

# process	# elements	# elem. / process	Ghost	Partition
49,152	1,099,511,627,776	22,369,621	2.08 s	0.73 s
98,304	1,099,511,627,776	11,184,811	1.43 s	0.33 s

Runtimes on JUQUEEN for the ghost layer and partitioning operations for a distributed mesh consisting of 1.1 trillion elements.





**Figure 5:** Runtimes on JUQUEEN of the different components of our DG prototype code coupled with t8code. Note that all features associated with dynamical mesh adaptation utilize only around 15% of the total runtime largely independent of the number of processes.

## Conclusion

In this note we introduce our open source AMR library t8code. We give a brief overview of the fundamental algorithms and data structures, namely our modular SFC, and outline a general usage pattern when an application interacts with the library. Due to its high modularity, t8code can be easily extended for a wide range of use cases. Performance results confirm that t8code is a solid choice for mesh management in high-performance applications in the upcoming exascale era.

Future efforts will include an integration of our techniques into simulation use cases with in-depth performance and accuracy evaluations. Additionally, we strive to extend all presented features to all element shapes and space dimensions. Other possible extensions that we plan to research in the near future are mesh adaption of prism boundary layers and the support for an-isotropic refinement.

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